Shubham Agarwal

RESEARCH INTEREST

My research interests lie at the intersection of **Machine Learning and Systems**, focusing on optimizing inference efficiency for generative AI models and enhancing cloud infrastructure reliability. I have designed and published caching-based strategies to reduce inference cost and latency, as well as ML-driven proactive outage management techniques for improving system uptime.

EDUCATION

Ph.D. in Computer Science

2024 - present

University of California, Berkeley - Advisor: Prof. Ion Stoica, Prof. Aditya Parameswaran

Bachelors in Computer Science

2018 - 2022

Birla Institute of Technology and Science (BITS) Pilani, Pilani Campus, India

GPA: 9.95/10.00

RESEARCH EXPERIENCE

Research Associate II - Adobe Research, India

Jul 2022 - 2025

Systems and Insights Group. Mentors: Dr. Subrata Mitra, Dr. Shiv K Saini

- Designed a high throughput inference serving system for generative models by employing caching techniques.
- Developed an outage forecasting and root cause diagnosis pipeline for microservice-based cloud systems.
- Published 7 papers, filed 6 patents, and successfully integrated research innovations into 3 products.

Research Intern - American Express, India

Jan 2022 - Jul 2022

Document Analytics & Intelligence Lab. Mentor: Dr. Himanshu S Bhatt

- Designed a multi-modal deep learning pipeline for processing visually rich documents by customizing LayoutLM.
- Developed a few-shot learning pipeline for rapid adaptation to new document types with synthetic data augmentation.
- Implemented a collaborative inference framework using server-side PyTorch and on-device TFLite models.

Research Intern – Adobe Research, India

May 2021 - Aug 2021

Big Data Intelligence Lab. Mentor: Dr. Shiv K Saini

- Modeled the degradation in QoS metrics distribution as a function of system metrics to forecast rare outages.
- Used a Mixture Density Network trained with tail regularization to improve precision in distribution forecasting.
- Resulted in a full research paper **publication** at FSE 2023 and a US **patent** issuance.

Publications * equal contribution

- [1] **S Agarwal***, S Sundaresan*, S Mitra, D Mahapatra, A Gupta, R Sharma, NJ Kapu, T Yu, S Saini. "Cache-craft: Managing chunk-caches for efficient retrieval-augmented generation." In *The Proceedings of the ACM on Management of Data*. <u>SIGMOD 2025</u>. (acceptance rate 20%)
- [2] A Ikram, K Lee, **S Agarwal**, S Saini, S Bagchi, and M Kocaoglu. "Root Cause Analysis of Failures from Partial Causal Structures." In *The 41st Conference on Uncertainty in Artificial Intelligence*. <u>UAI 2025</u>. (acceptance rate 30%)
- [3] **S Agarwal**, S Mitra, S Chakraborty, S Karanam, K Mukherjee, and S Saini. "Approximate Caching for Efficiently Serving Text-to-Image Diffusion Models." In *The 21st USENIX Symposium on Networked Systems Design and Implementation*. NSDI 2024. (acceptance rate 18%)
- [4] C Lu*, **S Agarwal***, M Tanjim, K Mahadik, A Rao, S Mitra, S Saini, S Bagchi, S Chaterji. "ReCon: Training-Free Acceleration for Text-to-Image Synthesis with Retrieval of Concept Prompt Trajectories." In *The 18th European Conference on Computer Vision*. ECCV 2024. (acceptance rate 27.9%)
- [5] G S Ahmad, **S Agarwal**, S Mitra, R A Rossi, M Doshi, and S Paila. "ScaleViz: Scaling Visualization Recommendation Models on Large Data." In *The 21st Pacific-Asia Conference on Knowledge Discovery and Data Mining*. PAKDD 2024. (Oral acceptance 18.75%)
- [6] **S Agarwal**, S Chakraborty, S Garg, S Bisht, C Jain, A Gonuguntla, and S Saini. "Outage-Watch: Early Prediction of Outages using Extreme Event Regularizer." In *The 31st ACM Joint European Software Engineering Conference and Symposium on the Foundations of Software Engineering*. FSE 2023. (acceptance rate 25.6%)
- [7] S Chakraborty, **S Agarwal**, S Garg, A Sethia, U Pandey, V Aggarwal, and S Saini. "ESRO: Experience Assisted Service Reliability against Outages." In *The 38th IEEE/ACM International Conference on Automated Software Engineering*. <u>ASE 2023</u>. (acceptance 21.3%)
- [8] S Chakraborty, S Garg*, S Agarwal*, A Chauhan, and S Saini. "CausIL: Causal Graph for Instance Level Microservice Data." In Proceedings of The Web Conference. WWW 2023. (acceptance rate 19.2%)
- [9] **S Agarwal**, G Chan, S Garg, T Yu, and S Mitra. "Fast Natural Language Based Data Exploration with Samples." In *Companion of the 2023 International Conference on Management of Data*. <u>SIGMOD 2023</u> (*Demo track*).

Under review:

- [1] **S Agarwal**, S Iqbal, and S Mitra. "Micro-managing Prompts for High-Throughput Text-to-Image Inference Serving using Approximation." (accepted with shepherding at Middleware'25)
- [2] D Mahapatra*, **S Agarwal***, A Saxena, S Mitra. "RCStat: A Statistical Framework for using Relative Contextualization in Transformers." (submitted to ICLR'25)

PATENTS

- [1] D Mahapatra, S Agarwal, et al., Relative Contextualization using Pre-Softmax Logits in Transformers. [US Patent 19/285,322]
- [2] S Agarwal, et al., Managing Chunk Caches for Efficient Retrieval-Augmented Generation in LLMs. [US Patent 19/074,061]
- [3] C Lu, S Agarwal, et al., Recon: Acceleration for Text-to-Image Synthesis with Concept Trajectories. [US Patent 63/698,535]
- [4] S Agarwal, S Mitra, S Iqbal, Micromanaging Prompts for High-Throughput Text-to-Image Inference. [US Patent 18/808,654]
- [5] S Agarwal, S Mitra, S Chakraborty, et al., Intermediate Noise Retrieval for Image Generation. [US Patent 18/637,024]
- [6] S Agarwal, S Mitra, et al., Using Reinforcement Learning to recommend Data Visualizations. [US Patent 18/668,888]
- [7] S Mitra, S Agarwal, G Chan, et al., Data Exploration using Natural Language with Data Sampling. [US Patent 18/675,930]
- [8] S Garg, S Agarwal, S Bisht, N Sheoran, et al., A System and Method for Outage Forecasting. [US Patent 17/656,263]

SELECTED PROJECTS

Efficient Inference Strategies (Systems for ML)

Papers published in [NSDI '24, ECCV '24, PAKDD '24]

- Efficient Chunk-Caching for LLM-based RAG: Developed a Key-Value reuse mechanism that decomposes prefill states into reusable chunks, achieving a 2.7× reduction in prefill compute costs and latency while maintaining output quality.
- Approximate Caching for Diffusion Models (In Product): Developed a caching framework for diffusion models, achieving 19.8% latency reduction. Utilized a concept decomposition technique to improve generation fidelity. Implemented an accuracy scaling framework with query-aware routing, boosting system throughput by 30% without compromising quality.
- Scaling VizRec Models on Large Data: Designed a plug-in framework for Visualization Recommender systems that achieve up to 10× speedup in latency. It implements a scalable Deep Q-Learning to optimize input statistics selection.

Outage Detection and Diagnosis (ML for Systems)

Papers published in [FSE '23, ASE '23, WWW '23]

- Cloud Outage Prediction (In Product): Developed a model to predict QoS metrics distribution, reducing outage detection time by 88%. The system incorporates real-time metric retrieval from Prometheus to streamline inference and retraining.
- Root Cause Diagnosis and Resolution: Developed a novel causal discovery technique and an automated framework linking incidents to historical cases, achieving a 27% improvement in root cause identification and remediation recommendations.
- **Query Latency Prediction (In Product)**: Built a pipeline to predict Spark job latency, now used by over **50**+ engineers for real-time monitoring. The tool ingests job metadata from Kafka and uses Azure functions to scale the deployment.

RESEARCH COLLABORATIONS

• Training-free acceleration for text-to-image synthesis using prompt trajectories with Prof. Somali Chaterji and Prof. Saurabh Bagchi, Purdue University

Oct 2023 – Jul 2024

- Designed a novel concept retrieval-based method for accelerating diffusion models (paper at ECCV '24).
- Causality-based Root Cause Diagnosis for real-world microservice architectures with Prof. Saurabh Bagchi, CRISP Lab, Purdue University

Jul 2023 – Mar 2025

- Developed a graph-based causal inference algorithm for RCA in complex systems (paper at UAI '25).

TECHNICAL SKILLS

- Programming languages: Python, C, C++, Triton, Java, SQL, Verilog, MIPS
- · Packages & Frameworks: PyTorch, Keras, TensorFlow, scikit-learn, Git, Docker, Kubernetes, Kafka

Undergraduate Courses:

Operating Systems, Database Systems, Computer Networks, Compilers, Computer Architecture, Artificial Intelligence, Information Retrieval, Data Structures and Algorithms, Probability and Statistics, Linear Algebra

ACTIVITIES & ACHIEVEMENTS

- Industry mentor for UMass Master's students' group, guiding research on RAG systems and on-device model security.
- Mentored over 10 undergraduate interns and collaborated with 3 PhD interns during summer internships at Adobe.
- Contributed to multiple paper reviews for technical conferences including ATC, AISTATS, AAAI, Middleware, etc.
- Co-led cross-institutional collaborations with researchers from Purdue and UMass, organizing workshops and talks.
- Awarded with 100% merit scholarship for academic excellence across all semesters; ranking top among all students.
- $\bullet \ \ Served \ as \ the \ Student \ Representative \ for \ the \ Student-Faculty \ Council, \ representing \ over \ 1,000 \ undergraduate \ students.$
- Successfully organized BITS Pilani's Annual Technical Fest, boosting external participation and outreach by 200%.